

Introduction

The generalized additive model (Hastie & Tibshirani 1990) was developed by statisticians nearly a decade ago, but its application in biological fields has occurred only in the last couple of years. Here we demonstrate its use in assessing the response of a sensitive biological attribute (carbon gain) to cumulative O₃ exposure or uptake. We chose carbon gain (gross photosynthesis) as the biological response attribute because it responds within a growing season to the stressors of interest (O₃, drought), and because it is linkable to total tree biomass via other models. However, a number of other biological response attributes could also be used (foliar injury as a single variable or in an index, tree biomass, wood production, etc). We used ponderosa pine because it is the most sensitive western US conifer to oxidant air pollution (Miller et al. 1983).

Ozone exposure indices for plants are based on the active growing season, hourly O₃ concentrations equal to or greater than a specified level, over a specified time (Stockton et al. 1997). Most exposure indices accumulate exposure over the entire growing season to correlate with biological responses. However, western forests commonly have a period of summer drought where stomatal conductance to water and O₃ is limited. Even in years with above-average precipitation with little change in predawn xylem potential, stomatal conductance declines after mid July when upper soil horizons dry. Because the statistical model can evaluate the effect of a single environmental stressor within the context of multiple stressors, we also evaluated whether drought stress was protective of, or deleterious to, carbon gain with accumulating O₃ exposure or uptake.

Using the general additive model, we assessed (1) at what value did cumulative O₃ exposure become deleterious to carbon gain at different sites; (2) whether cumulative O₃ exposure or uptake is a better metric for carbon gain; and (3) simultaneously tested the effect of the O₃ metric and drought stress in reducing carbon gain.

Approach

Seasonal gas exchange (net assimilation, dark respiration, stomatal conductance) was measured for twelve, statistically average 40-yr-old ponderosa pine trees in natural stands at each of four sites differing in pollutant exposure (and other factors) in three summers. O₃ concentration was measured on an hourly basis at each site, as well as other site microenvironmental factors. Because only 15% of the days during the growing season were foggy or cloudy, the model was very simple. The data from 1995 was used to develop first a model to predict stomatal conductance, and thus calculate O₃ uptake (Grulke et al. 2002a). The ability of the model to predict the measured gas exchange in a particular hour, on a particular day was tested in an average precipitation year (1993) and a 20% below-average precipitation year (1994): there was an excellent correlation. Another model was developed to then describe the seasonal changes in maximum daily carbon uptake (net assimilation plus dark respiration losses at the same leaf temperature, or gross photosynthesis) (Grulke et al. 2002b) in response to the O₃ metric (cumulative exposure or calculated uptake) and drought stress (as determined from predawn xylem potential). Because the data was taken on monthly time steps, we used a locally weighted polynomial smoothing routine (Cleveland and Devlin 1988) to estimate the functional relationship of O₃ metric simultaneously with the other terms in the model. The data suggest the shape of the relationship between the explanatory variables and the response of interest.

References cited:

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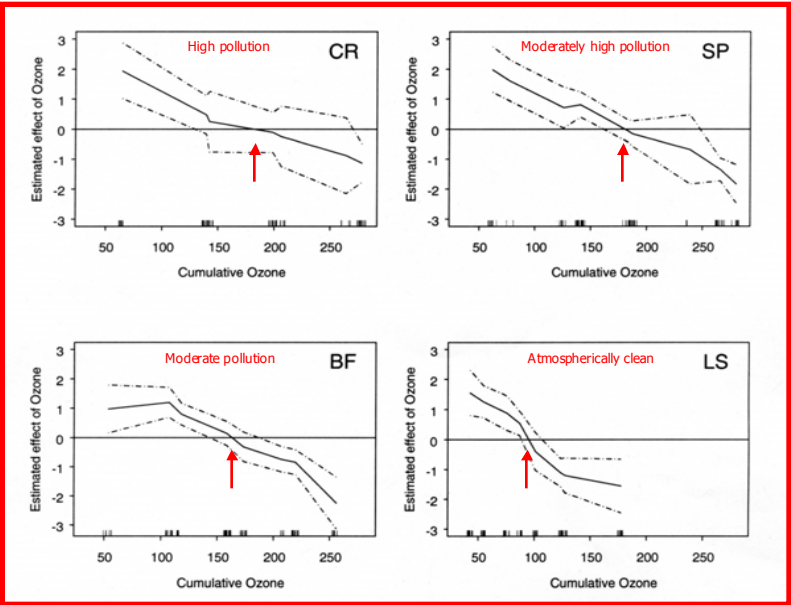
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A statistical tool for identifying biological threshold responses to O₃ exposure or uptake

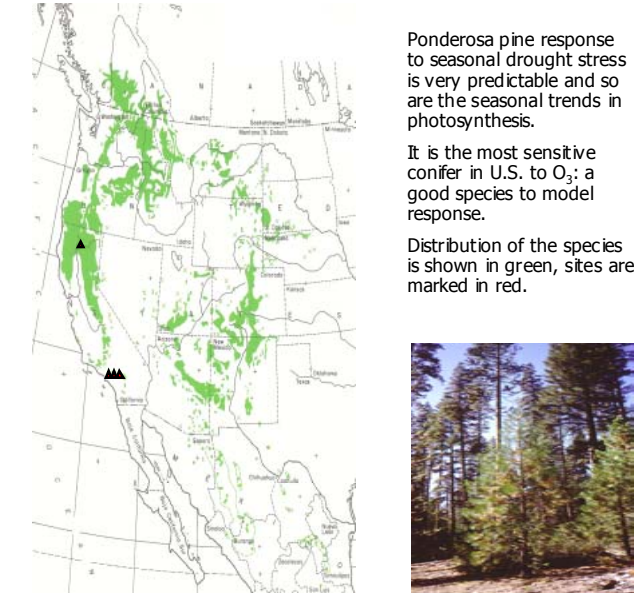
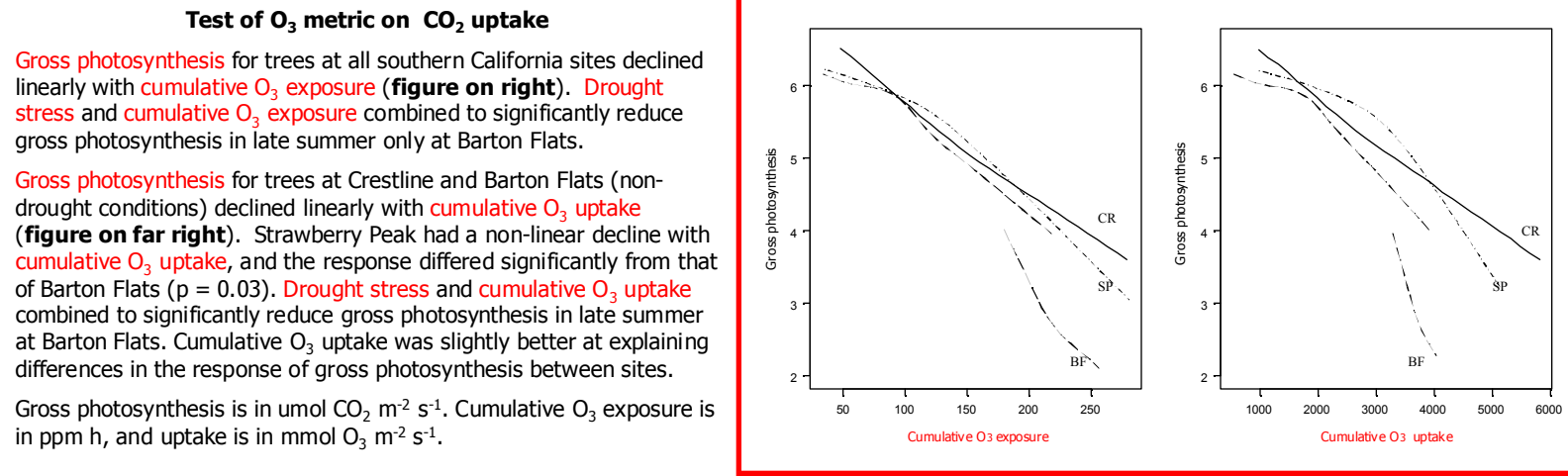
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Estimated effect of cumulative O₃ exposure on CO₂ uptake

Holding the influence of the other environmental factors constant, cumulative O₃ exposure decreased CO₂ uptake across the full range of exposure (**figure left**). The zero line indicates the average CO₂ uptake rate of 12 trees at each site. When the response line was above the zero line, it suggested that CO₂ uptake was higher than the site average at the given value of the x variate (cumulative O₃ exposure). Conversely, when the response line was below the zero line, it suggested that the CO₂ uptake was lower than the site average at that value of the x variate. The dotted lines indicate the 95% confidence interval about the response line.

The response of CO₂ uptake to cumulative O₃ exposure at CR and SP was not significantly different, and the regression lines crossed the zero line at the same level of cumulative O₃ exposure: 180 ppm h. At BF, cumulative O₃ exposure < 100 ppm h did not affect the relationship between CO₂ uptake and O₃ exposure. However, between 100 and 210 ppm h, CO₂ uptake declined linearly with cumulative O₃ exposure. At BF, the line crossed the zero line at 160 ppm h. At Lassen, the response line cross the zero line at 90 ppm h cumulative O₃ exposure. The effect of late season drought stress was statistically significant (p < 0.001) only at Barton Flats. The percentages of explained variation at the four sites were 35% (CR), 54% (SP), 47% (BF) and 74% (LS).



	Lassen (LS)	Barton Flats (BF)	Strawberry Pk (SP)	Crestline (CR)
Pollution level	near pristine	moderate	moderately high	high
O ₃ exposure, ppb h	38-42	62-64	69-76	79-80
N deposition, kg/ha yr	n.d.	9-Jun	n.d.	30-40
Soil N, % A: B:	.01, .01	.08, .04	.11, .07	.20, .09
Annual ppt, cm	161	90	96	98
Predawn xylem in 9/83, 9/94, MPa	-1.0, -1.1	-1.1, -1.7	-0.9, -1.6	-1.0, -1.7
Cumulative degree d	580, 680	1310, 1230	1980, 1820	2650, 2840
Growing season, d	88, 105	133, 78	113, 105	181, 170
Elevation, m	1700	1830	2240	1800

	LS	BF	SP	CR	p
Chlorotic mottle, %	1	8	19	24	0.001
Number of whorls	5.6	5.6	3.2	2.6	0.001
Needle length, mm	104	130	151	142	0.001
Branchlet length, mm	69	32	60	46	0.038
Branchlet dia., mm	4.7	5.7	5.1	5.6	0.410
Tree height, m	5.1	2.7	5	7.4	0.001
Bole diameter, cm	6.8	4.4	7.8	11	0.001

Table above: Summary of environmental variables at the four sites (see site locations on far right). These data are summarized from Kieffer and Fenn (1997), Grulke et al. (1998), and Grulke and Balduman (2000). **Table below:** Biological attributes of trees in used in this study. For foliar and branch attributes, previous year tissue in mid canopy was described.

Conclusions

- (1)Cumulative O₃ exposure was deleterious to CO₂ uptake at 180 ppm h at moderately high and high pollution sites, at 160 ppm h at a moderate pollution site, and at 90 ppm h at a relatively clean site. Cross-site comparisons can be made because the response line (CO₂ uptake to cumulative O₃ exposure) is relative to the population average CO₂ uptake rate *at that site*.
- (2)Cumulative O₃ uptake appeared to be slightly better than cumulative O₃ exposure in distinguishing differences in carbon gain between sites.
- (3)Late summer drought stress further reduced CO₂ uptake at only one site. The effect of drought stress was deleterious, not protective.



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